

Socioeconomic determinants of regional differences in outpatient antibiotic consumption: evidence from Switzerland.

M. Filippini * G. Masiero † K. Moschetti ‡

Published in *Health Policy*, 78 (2006)

Accepted: 28 September 2005

Abstract

This paper investigates the determinants of regional variations in outpatient antibiotic consumption using Swiss data. The analysis contributes to the debate on appropriate antibiotic use by improving the understanding of its determinants, and may help to define more effective health care policies to reduce the resistance phenomenon. Findings suggest that Switzerland exhibits relatively low levels of consumption among European countries. There are significant differences between cantons both in the per capita antibiotic sales and defined daily doses per 1000 inhabitants (DID). Econometric estimations suggest that DID are significantly related to per capita income, antibiotic price, the density of medical practices, demographic, cultural and educational factors. The incidence of bacterial infections is also relevant. Appropriate policies affecting antibiotic consumption in the community can be designed by looking at crucial determinants in the model and their related impact.

Keywords: Antibiotic use. Regional differences.

*University of Lugano; Swiss Federal Institute of Technology, Zurich, CH. Support from the Swiss National Science Foundation is acknowledged. We thank IHA-IMS for providing data on antibiotic sales. We are grateful to Cristina Masseria for collaboration on early stages of the related research project. We also thank Enos Bernasconi, Marco Bissig and three anonymous referees whose suggestions and advice stimulated further improvement of the previous draft. The usual disclaimer applies.

†University of Lugano, CH; University of Bergamo, Italy.

‡University of Lugano, CH.

1 Introduction

The consumption of antibiotics has rapidly increased during the past 50 years. Antibiotics have significantly contributed to the reduction in the likelihood of dying from infectious diseases worldwide (WHO, 2000; 2001). However, researchers suggest that almost one third of drug prescriptions are questionable (Wise et al., 1998; Homer et al., 2000).

Between 1980 and 1991 most European countries experienced an increase in the number of antibiotic prescriptions. The growth rate of consumption was about 45% for England, 65% for France and almost 80% for Germany. According to Davey (1996) a partial explanation is represented by the increasing use of antibiotics for respiratory symptoms. Antibiotic prescriptions have slightly decreased during the 90s but prescribing practices still vary widely across countries (Goossens et al. 2005). For instance, the percentage of antibiotic prescriptions for colds and tonsillopharyngitis between 1980 and 1991 were respectively 48.7% and 94.6% in France versus 7.7% and 69.6% in Germany (Bouvenot, 1999). During the same period the French consumption of antibiotics for respiratory infections with presumed viral origin increased by around 115% for children and 86% for adults (Guillemot et al., 1998). Mousquès et al. (2003) suggested that a change in physicians' behaviour may at least partially explain the large amount of prescriptions for acute rhinopharyngeal infections: there is a tendency to prescribe the most recent and the most costly antibiotics such as cephalosporins.

In the USA the use of broad spectrum antibiotics and prescriptions of antibiotics

for common viral diseases such as upper respiratory tract infections increased during the 90s (Steinman et al., 2003). Antibiotic prescription rates respectively for people with colds, URIs, and acute bronchitis was 46%, 47%, and 60% in 1996 (Cantrell et al., 2002). McCaig et al. (2003) showed that on average 45% of the population received antibiotics in 2000. The analysis of Cantrell et al. suggests that around 11 millions of prescriptions in the USA are inappropriate and estimates a waste of health care resources up to \$281 millions.

Antibiotic consumption may not be optimal because of multiple market imperfections. First, patients may not face the marginal cost of drugs when making their consumption choices. Consumers have an incentive to purchase more drugs than they would if insurance was not available (Newhouse, 1993). Second, the individual production function of health is characterized by uncertainty. Although antibiotics are not effective in treatments of viral diseases, patients' lack of knowledge and experience may increase inappropriate consumption. Indeed, studies have shown that doctors decisions to prescribe antimicrobials are related to patients' expectations. Under time pressure, doctors tend to satisfy their patients and to avoid follow up visits (Butler et al., 1998). Third, marginal social benefits from consumption may not reflect marginal private benefits. Marginal private benefits from consumption may not internalize external benefits derived from one's treatment with antibiotics which reduces the probability of infection spreading to other individuals (Elbasha, 2003). Finally, over consumption of antibiotics may contribute to the selection of resistant bacteria, and hence, reduce their effectiveness (McGowan, 2001). Marginal social costs of antibiotic usage may then not reflect marginal private costs since the

latter do not consider the costs of reduced antibiotic effectiveness due to bacterial resistance (Levy, 1998; Coast et al., 1998). Because of resistance, antibiotics become a scarce resource and it is in the interest of the society as a whole to preserve their effectiveness (Laxminarayan and Weitzman, 2002; Rowthorn and Brown, 2003; Rudholm, 2002).

The investigation of regional variations in antibiotic use may contribute to the debate on appropriate antibiotic use by improving the understanding of its determinants. Moreover, the analysis may help to define more effective health care policies to reduce the resistance phenomenon.

Differences between geographical areas may be explained by demographic, cultural, and socioeconomic factors. However, it is hard to believe that physicians and/or patients in different areas will not vary in their preferred treatment practices for health conditions where alternative treatments are available and where the nature of the infection exhibits substantial uncertainty. Researchers suggest that the investigation of small geographical areas may bring out the role of health care supply organizational factors compared to demand variables (Wennberg and Gittelsohn, 1982).

The literature lacks empirical investigation of within country variations in antibiotic use. Moreover, studies focusing on international comparisons between countries use a descriptive statistics approach rather than applying econometric techniques to explain the determinants of cross-country variations (Bremon et al. 2000).

The paper intends to investigate regional variations in outpatient antibiotic use in Switzerland, to estimate the cantonal demand for antibiotics and study the impact

of critical factors. In section 2 we compare outpatient antibiotic sales in Switzerland with other European countries and investigate cantonal differences within the country. In section 3 we estimate the cantonal demand for outpatient antibiotics and discuss its determinants. Section 4 concludes.

2 Variations in antibiotic consumption

2.1 Outpatient antibiotic use in Switzerland

In this section, we investigate outpatient antibiotic utilization in Switzerland and compare it with use in other European countries. We consider both total use in terms of defined daily doses per 1000 inhabitants per day (DID)¹ and sales per capita. Swiss sales data were provided by IHA-IMS Health. Defined daily doses per 1000 inhabitants daily and sales per capita were calculated using additional demographic information and WHO standard doses (we refer the reader to section 3.2 for further details on data).

Figure 1 is constructed by using data from the European Surveillance of Antimicrobial Consumption (ESAC I) project and by including new data from Switzerland. The ESAC project collected either reimbursement data or distribution/sales data depending on the method for measuring antibiotic use employed by each national database. Antibiotic sales, prescribing and consumption are then used interchangeably in the European study although concepts are not exactly the same. Patients may systematically lack compliance either because they badly tolerate the treatment or because symptoms have resolved. Moreover, as suggested by Cizman (2003),

¹The defined daily dose (DDD) measurement unit is based upon the WHO version 2003.

physicians may overprescribe antibiotics to meet patient’s expectations or to reduce misdiagnosis of bacterial infections. As a result prescribing data may overestimate antibiotic consumption. As for wholesales to dispensing pharmacies, doctors and drugstores, these may not match prescribing data if drugs can also be purchased without any prescription. However, this is unlikely to happen for antibiotics. A mismatch between wholesales and prescribing data may derive instead from seasonal fluctuations of retailers’ stocks of drugs due, for instance, to unexpected variations in the incidence of infections. In our analysis we will also ignore the possible mismatches between antibiotic sales and antibiotic consumption and use either one term or the other interchangeably.

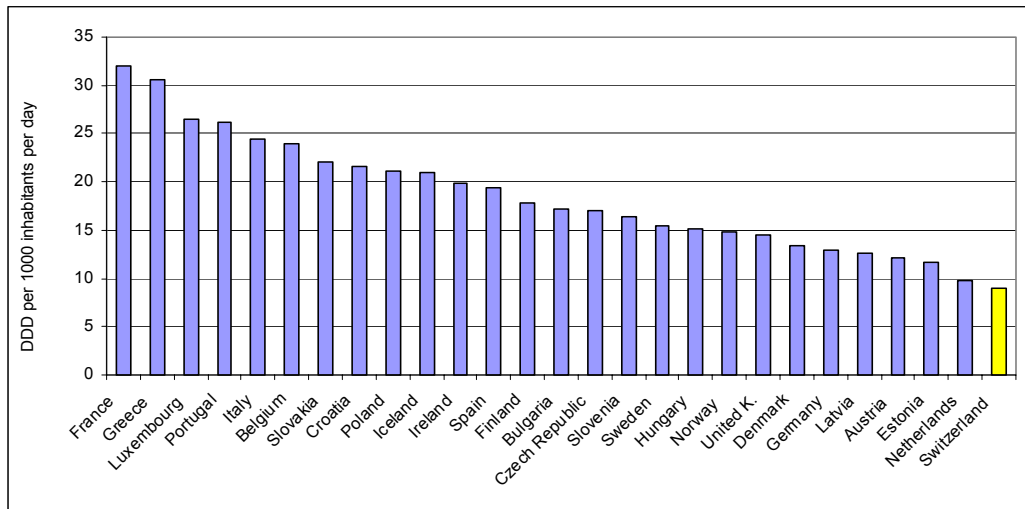


Figure 1: Outpatient antibiotic use per country including Switzerland (2002). Sources: ESAC and IHA-IMS.

Large differences in outpatient antibiotic consumption are observed across European countries (Cars et al. 2001 ; Goossens et al., 2005). Relatively high consumption defined in daily doses per 1000 inhabitants per day (DID) are observed in France,

Greece, Luxembourg, Portugal, and Italy, among others. On the contrary, Austria, Estonia, Germany, Latvia, and the Netherlands, for instance, exhibit significantly lower values. Median European consumption of antibiotics in ambulatory care in 2002 is 18.8 DID. The greatest consumption (32 DID) is attained by France. Outpatient antibiotic use in Switzerland measured in DDDs per 1000 inhabitants daily is 9 DID, below the Dutch level of 9.8 DID.

The ranking obtained by ordering European countries as with respect to DDDs per 1000 inhabitants per day in 2002 suggests that Switzerland is indeed the country with the lowest antibiotic consumption in the community.

Not surprisingly, this is in accordance with the 2003 OECD statistics (OECD, 2003) suggesting that Switzerland is among countries with low consumption rates of pharmaceuticals. Among possible explanations is the combination of organizational aspects of the health care system based upon private health insurances and physicians' and patients' attitude towards the use of drugs. The combination of deductible and direct payments may contribute to the prevention of moral hazard behavior. Swiss physicians and patients may either be more aware of the implications of antibiotic consumption, such as bacterial resistance, and face tighter financial incentives. The health economics literature suggests that pure fee-for-service payment schemes, akin to the Swiss one, may increase the volume of services provided compared to capitation regimes. However, the incentive to reduce workload by increasing prescriptions may be lower (see Scott, 2000).

As shown in figure 2, total antibiotic consumption in ambulatory care in Switzerland has been roughly stable over the three years considered. Consumption has

slightly increased in 2003 (9.5 DID) but decreased in 2004 (9.3 DID).

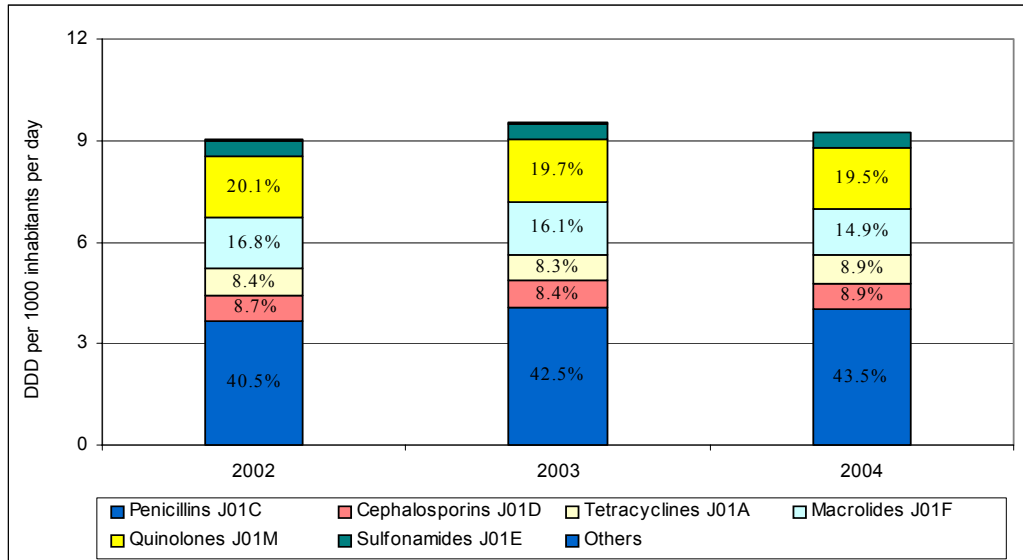


Figure 2: Structure of outpatient antibiotic consumption in Switzerland (2002-2004).

Looking at the consumption structure, the literature suggests that there is wide variation in the proportion of different classes of antibiotics between countries (Bergan, 2001; Cizman 2003). The Swiss share of quinolones is 20.1% of total consumption in 2002. Although the Swiss use of quinolones is not far from the European average (1.8 DID against 1.4 DID), Switzerland uses this category of antibiotics in the community in much higher proportions (the European average share of quinolones without Switzerland is 7.3%). This implies that Switzerland uses relatively lower proportions of others classes of antibiotics compared to European countries.

The use of penicillins has slightly increased over time (from 40.5% in 2002 to 43.5% in 2004). The Swiss consumption of penicillins is below the European average both in terms of DID and the share on total consumption (3.7 DID and 40.5% compared to 8.7

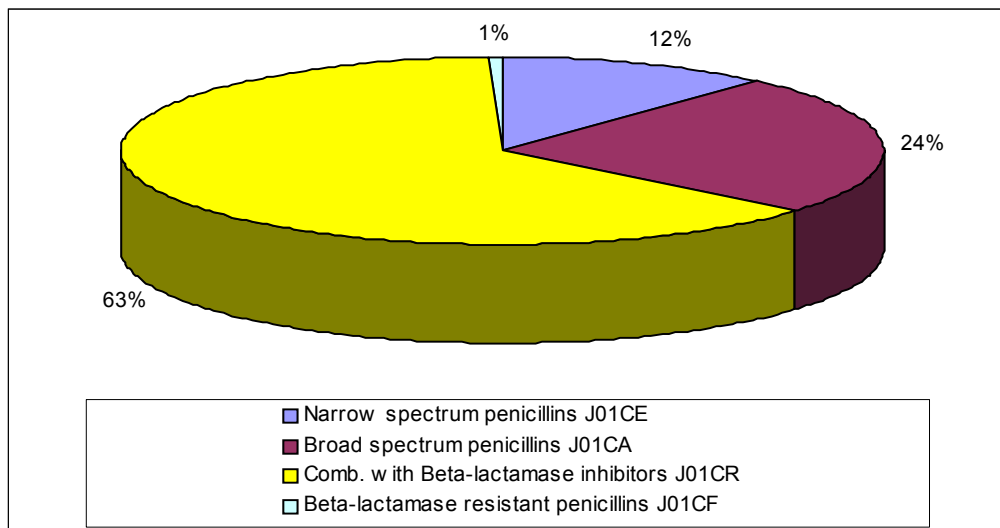


Figure 3: Penicillins composition in Switzerland (2002).

DID and 46.4%). Looking at penicillins in more details, we observe that combinations with β -lactamase inhibitors represents 63% of total consumption of penicillins (figure 3). This proportion is similar to the proportion used in Belgium and Portugal, for instance, and above the European average

Similar figures can be observed for cephalosporins and macrolides. The Swiss consumption for the former category is 0.8 DID (8.7%) whereas the European average is 1.9 DID (10.2%). In the latter category Switzerland consumes 1.5 DID (16.8%) compared to the European average of 2.7 DID (14.3%).

The ranking of Switzerland between European countries in terms of per capita consumption for different classes of antibiotics can then vary. Switzerland is 18th out of 27 European countries for the consumption of cephalosporins, and the 5th least consuming country for macrolides. On the other side, Switzerland is the 8th larger consumer of quinolones.

It is worth noticing that the comparison of Swiss consumption data with those of other European countries as well as between the European countries of the ESAC study requires a bit of carefulness. There may be differences related to the collection of data since not all of the countries derive data from the same source. These may either come from the distributional channel or the reimbursement registrations which may not perfectly match. Moreover, outpatient antibiotic consumption may either include or exclude antibiotic used in nursing homes. Nursing homes are generally counted in outpatient antibiotic consumption of most European countries although for few of them they are included in the hospital consumption.

2.2 Cantonal differences

Switzerland is a federal state made of 26 cantons. Cantons generally differ not only with respect to geographical characteristics, but also for cultural and socioeconomic aspects of the population and the organization of the health care system. The analysis of cantonal differences in antibiotic consumption may then reflect these aspects besides epidemiological ones. We investigate cantonal antibiotic use in terms of sales (in CHF) per capita and DDDs per 1000 inhabitants daily using yearly data from 2002 to 2004².

The average cantonal expenditure in 2002 was around CHF 12 per capita with a standard deviation of 3.72. The expenditure varies from a minimum of CHF 6.44 to a maximum of CHF 22.63. Average per capita expenditure has increased between 2002 and 2003 by 3.2% and decreased afterwards by 4.5%. Differences between cantons

²In the analysis which follows 5 small cantons have been aggregated into 2 bigger regions (see section 3.2 for further details).

appear to be significantly large all over the three years.

In terms of DDDs per 1000 inhabitants per day, the average cantonal outpatient antibiotic consumption was 9 DID in 2002 (figure 4). Average antibiotic use has slightly increased in 2003 and then reduced to 9.3 DID in 2004. Hence, average individual consumption daily has been roughly stable over the three years. Note, however, the wide differences between cantons. These can be summarized by the variation coefficient³: 29 in 2002, 26 in 2003, and 26 in 2004. Given a minimum cantonal consumption of 4.7 DID in 2002 (AR - Appenzell Rhodes), the highest consumption is more than 3 times greater (15.6 DID for GE - Geneva). Similar figures are observed for 2003 (min. 5.3 DID - Max. 16 DID) and 2004 (min. 5.3 DID - Max. 15.4 DID). Median values were 7.7 DID in 2002 (ZH - Zurich), 8.3 DID in 2003 and 2004 (SO - Solothurn and Zurich).

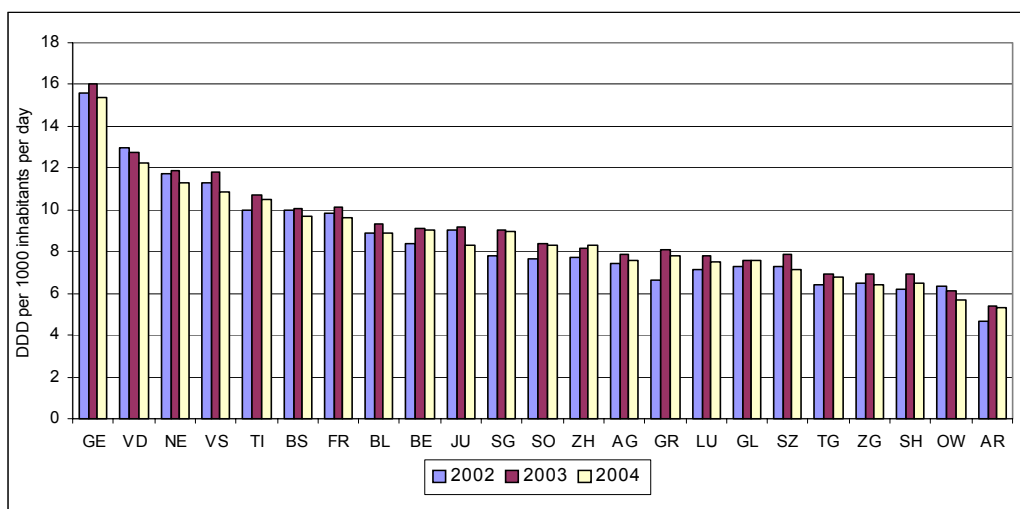


Figure 4: Outpatient antibiotic use per canton.

³The variation coefficient is the ratio between the standard deviation and the mean multiplied by 100.

Although there are substantial cantonal differences in all of the three years observed, the variation coefficient indicates that differences has slightly reduced over time. In 2003 the big majority of cantons have increased antibiotic use expressed in DDDs per 1000 inhabitants daily but two cantons (VD - Vaud and OW - Obwalden) have reduced consumption. On average, consumption has increased by 5.6%. However, cantons such as St. Gall (SG) and Grisons (GR) exhibit more substantial growth. The t-test on the mean equality between 2002 and 2003 confirms that cantonal consumption has significantly increased. In 2004 average outpatient antibiotic consumption expressed in DID has decreased by 2.7% compared to 2003. The reduction characterizes all cantons with the exception of Zurich.

Looking more carefully at figure 4, we note that cantons with the highest consumption (such as Geneva, Vaud, Neuchatel and Valais) are generally located in the South-West part of Switzerland. Conversely, cantons with the lowest consumption are located North-East in the country.

Cantonal antibiotic consumption can be disaggregated by main antibiotic classes (figure 2). We summarize the following 6 categories as previously done for the whole Switzerland: penicillins, cephalosporins, tetracyclines, macrolides, quinolones, and sulfonamides. Cantonal differences can be observed in the structure of total consumption (figure 5). The proportion of penicillins use is between a minimum of 33.5% in Obwalden and a maximum of 44.8% in Solothurn. Macrolides range from 12.7% to 22.1% whereas quinolones vary from 17.2% to 23.1%. Although there are clearly differences in the cantonal consumption structure, figures suggest that within country variations are less substantial compared to those observed across European countries

(see Goossens et al., 2005). Cantonal differences in terms of the proportion of each antibiotic category on total consumption may be related to local variables such as the prevalence of infections, patients' and doctors' preferences, pharmaceutical marketing strategies, cantonal regulation, and the incidence of bacterial resistance.

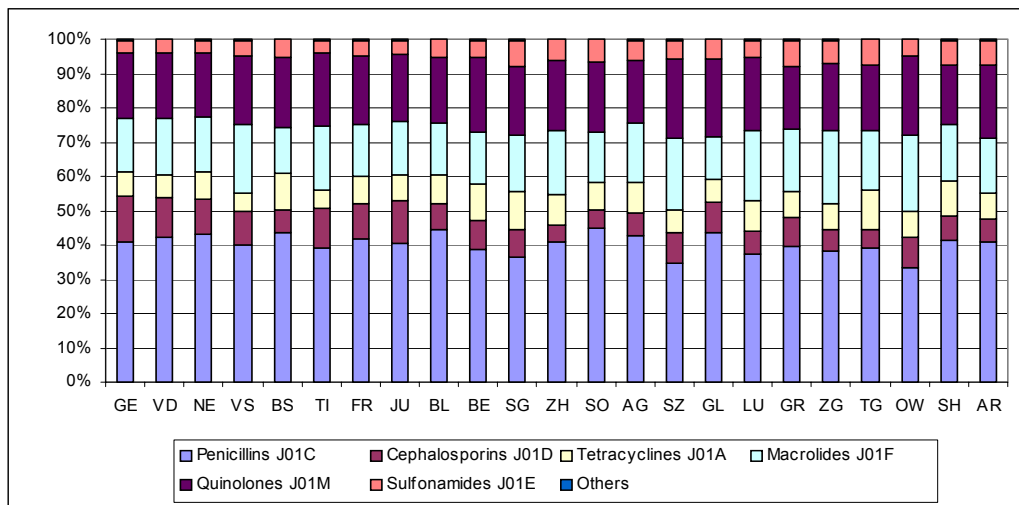


Figure 5: Structure of antibiotic consumption in the community per canton.

3 Explaining variations

Regional variations in antibiotic consumption may be explained by a variety of factors. Several authors have suggested that doctors' decision to prescribe and patients' use of antibiotics are explained not only by clinical factors and by differences in bacterial infections across regions. Difference in bacterial infection can hardly explain variation in morbidity as large as four fold among industrialized countries. The literature has suggested the lack of education, physicians and patients' expectations, uncertainty, cultural and social behavior, and differences in regulatory practice, among other

factors (Belongia and Schwatz, 1998; Finch et al. 2004).

Previous studies focusing on the determinants of antibiotic consumption have been conducted either in the form of trials or questionnaire surveys. Mecfarlane et al. (2002) investigated the impact of patient's information. Their experiment showed that the distribution of information leaflets to patients not in need for antimicrobials effectively reduced their use without affecting the doctor-patient relationship. Using a questionnaire survey on 22 Australian non-randomly selected general practitioners and 336 patients, Cockburn and Pit (1997) showed that patients expecting a medication were nearly three times more likely to receive it compared to other patients. Moreover, patients were ten times more likely to receive a medication if practitioners perceived a patient's expectation on prescribing. Doctors' perception and patients' expectations were significantly associated to each other. Webb and Lloyd (1994) suggested that older people are more likely to be prescribed a medication, although this result is not confirmed by Cockburn and Pit's study. Harbarth et al. (2002) suggested that large differences in antibiotic consumption between France and Germany are at least partially related to differences in the concentration of child care facilities and the use of breast feeding between the two countries. Finally, Unsworth and Walley (2001) showed that antibiotic prescribing is related to practice characteristics in the British NHS. Deprived and single-handed practices tend to prescribe more but cheap antibiotics, while dispensers and trainers, with low level of deprivation and early wave fundholders have lower rate of prescriptions.

An alternative approach to investigate the determinants of antibiotic consumption is to use regional consumption data and regress them against a set of variables

suggested by the literature as plausible causal factors of the demand for drugs. This approach is applied, for instance, by Di Matteo (2005) to investigate the macro determinants of health expenditure in the United States and Canada. We apply a similar approach to regional outpatient antibiotic consumption in Switzerland and discuss it in the following section.

3.1 An econometric approach

From the economic point of view, antibiotics are an input of the health care and the health production process. Therefore, following the Grossman's tradition it is possible to derive the demand for antibiotics directly from the demand for health care. In this framework, the demand for antibiotics is a demand derived from the demand for healthy days and can be specified using the basic framework of household production theory⁴. In this framework, a household combines drugs, health care, time, exercise, education and capital equipment to produce healthy days.

Inspired by this approach and given the restriction of aggregate data⁵, it is possible to specify an ad-hoc demand function for the cantonal per capita outpatient antibiotic consumption, where the demand for antibiotics depends on the individual's stock of health care (H), income (Y), prices of antibiotics and prices of other health care services, the incidence of infectious diseases and other socioeconomic variables such as age, nationality and education.⁶ These socioeconomic variables are usually included

⁴For a precise presentation of the household production theory, see Becker (1965). See also Grossman (1972) for an application of household production theory to health care.

⁵An alternative approach would be to use more disaggregated data even at individual level. However, such a dataset was not available.

⁶Of course, we are aware that the use of aggregated data to explain individual antibiotics consumption implies the assumption that the hypothesized relationship between the economic variables

in the model as proxies for the individual stock of health care, which is difficult to measure. Moreover, under a pure fee-for-service reimbursement scheme, there may be incentives to induce the demand for physicians' services⁷. Thus, the demand for antibiotics could also depend on some characteristics of the supply of health care services as physicians' density.

Taking into account the availability and the quality of data for the Swiss cantons, we first specify the following parsimonious empirical model (*Model 1*) for the per capita demand of outpatient antibiotics:

$$\begin{aligned}
 DID_{it} = & f(Y_i, P_{it}, DPH_i, UNDER20_i, OVER65_i, FO_i, EDU_i, \\
 & INF_i, DLATIN, DT_t),
 \end{aligned} \tag{1}$$

where DID_{it} are per capita antibiotic sales in canton i and quarter t , measured in defined daily doses, Y_i is the cantonal per capita income, P_{it} is the price of a defined daily dose, DPH_i is the cantonal physicians' density, $OVER65_i$ indicates the percentage of the population older than 65, $UNDER20_i$ is the percentage of the population below 20, FO_i is the share of foreigners on total population and EDU_i is the percentage of individuals without post-mandatory education. The incidence of infections (INF_i) is taken into account by the number of campylobacter infections per 100,000 inhabitants per year. As stressed by Lederberger et al. (2003), campylobacter is a major cause of foodborne bacterial gastrointestinal human infections in Switzerland.⁸ A "cultural" dummy ($DLATIN$) that takes into account similarities

in question is homogeneous across all individuals. Therefore, using this aggregate data set at the cantonal level we could encounter an aggregation bias.

⁷For a summary reading of the supply-induced demand theory see McGuire (2000).

⁸Streptococcus pneumoniae was also an important bacteria responsible for the large majority of

with adjacent countries and cultural differences across Switzerland is also included. Lecomte and Paris (1994) suggested that socio-cultural factors which are hard to measure might explain differences in consumption patterns between European countries. For instance, they underline the relevance of the medical training since German students are more likely to learn homoeopathic principles whereas UK students are more likely to recognize the importance of primary care. We divided cantons in two groups: “Latin”, “non-Latin”. The “Latin” group includes French and Italian speaking cantons (GE, VD, NE, FR, VS, TI, JU) whereas “non-Latin” includes German speaking cantons (BS, BL, BE, SG, ZH, SO, AG, SZ, GL, LU, GR, ZG, TG, OW, SH, AR).⁹ Finally, DT_t is a dummy variable to control for seasonal effects of antibiotic use. This takes value equal to 1 for period t ($t = 1, 2, 3, 4$); otherwise is 0.

Estimation of equation (1) requires the specification of a functional form. Several alternative forms could be considered since the theory of demand is quite ambiguous regarding this issue. The log-log specification offers an appropriate functional form for investigating the responsiveness of antibiotic sales to changes in a number of explanatory variables. The major advantage is that the estimated coefficients can be interpreted as elasticities¹⁰, which are, therefore, assumed to be constant. By

respiratory tract infections and a good candidate as an indicator of the incidence of infections. Since data on campylobacter infections appear to be more reliable than data on streptococcus infections we used the former as an explanatory variable in our models.

⁹Looking at the values of the partial correlation coefficient between the explanatory variables and the dependent variable we observe some variables with a negative sign, Y (-0.14), P (-0.27) and UNDER20 (-0.33) and some variables with a positive sign, OVER65 (0.13), DPH (0.62), EDU (0.08), FO (0.54), INF (0.13), DLATIN (0.7).

¹⁰This means that coefficients represent the percentage change in the value of the explained variable corresponding to a one percent variation in the value of the explanatory variable.

applying the log-log functional form, the model (*Model 1*) can be written as:

$$\begin{aligned} \ln DID_{it} = & \beta_0 + \beta_1 \ln Y_i + \beta_2 \ln P_{it} + \beta_3 \ln DPH_i + \beta_4 \ln UNDER20_i \\ & + \beta_5 \ln OVER65_i + \beta_6 \ln FO_i + \beta_7 \ln EDU_i + \beta_8 \ln INF_i \\ & + \beta_9 DLATIN + \beta_{10} DT_1 + \beta_{11} DT_2 + \beta_{12} DT_3 + \varepsilon_{it}, \end{aligned} \quad (2)$$

where $\ln()$ is a natural logarithm applied to the variable.

However, since prices and the number of infections are plausibly endogenous, the estimation of equation (2) may lead to biased results. To tackle this problem we consider two alternative approaches: the inclusion of lagged values (*Model 2*) and the instrumental variable method (*Model 3*). In *Model 2* instead of P_{it} we use P_{it-1} - the lagged price of a defined daily dose -, and instead of INF_i we use $MEANINF_i$ - the average number of infections calculated over the years 1999-2001 -. The estimation of *Model 1* and *Model 2* was carried out by using an OLS estimation procedure and a GLS estimation procedure for pooled time-series and cross-sectional data suggested by Kmenta (1986).¹¹

If the spread of a disease is a dynamic process an instrumental variable may be preferred. Thus, we specify a model (*Model 3*) by instrumenting the number of campylobacter infections (INF_i) with the average number of infections over the past three years ($MEANINF_i$) and three additional variables: the density of the

¹¹From the econometric point of view, we should consider that our panel data set is characterized by a relatively small number of time periods, a limited number of cross-sectional units and a zero within variation for most of the explanatory variables. The only two variables that are changing over time are the outpatient per capita consumption and the price of an antibiotic daily dose. Hence, the least squares dummy variable model and the error components model are not appropriate. For this reason we use the Kmenta approach. For a general presentation of this econometric procedure see Kmenta (1986) and Greene (2003). The estimation has been performed using the econometric software "STATA8".

population ($DPOP_i$), the mortality rate amenable to health care (MOR_i)¹², and the poverty rate (POV_i)¹³. In this case, a two-stage least squares approach is applied. Since data on most explanatory variables are limited to four quarters, the inclusion of lagged prices will restrict the number of observations available for the estimation. *Model 2* and *Model 3* are then estimated by using antibiotic sales for only three quarters.

3.2 The data

The data for the estimation of equation (2) were obtained from three sources. Information on the per capita income, physicians' density, demographic structure of the population, the share of foreign people, the level of education, the number of campylobacter infections and the poverty rate were extracted from yearly publications by the Swiss Federal Statistical Office. Mortality amenable to health care was obtained from the Department of Health of the Canton Ticino. Data on antibiotic sales and prices were provided by IHA-IMS Health Market Research. The data set includes aggregate outpatient antibiotic expenditure and quantities of different classes of antibiotics for Switzerland. Quarterly data were available for three years (2002-2004) and detailed at cantonal level. For privacy reasons five small cantons have been aggregated to obtain two "macro" cantons in the dataset so that the total number of

¹²The rate is defined as the proportion of "untimely and unnecessary" deaths in the total population from diseases for which effective health care is available (Rutstein et al., 1976). The rate for Swiss cantons is derived by the Department of Health of the Canton Ticino following the method applied by Nolte and McKee (2003).

¹³The poverty rate indicates the proportion of individuals below the "poverty threshold" over the population of residents. The "poverty threshold" is defined by a level of total income according to the rules of the CSIAS (Conférence suisse des institutions d'action sociale). Its current amount is CHF 1800 (1161) for a household of only one individual.

cantons was reduced to 23 instead of 26.¹⁴

Data on antibiotic sales derives from transactions between wholesalers and pharmacies and physicians in Switzerland. Since the retailers' stock of drugs is roughly constant over time, wholesales data provide a good estimation of outpatient antibiotic consumption in the country. However, our data may slightly underestimate total sales for three main reasons. First, data collected for ambulatory care at least partially exclude drugs delivered in nursing home facilities.¹⁵ Second, errors in data collection measurements may account for approximately 5% of the data which are missing. Third, since the aim of our analysis is to focus on ambulatory care, few antibiotic classes mainly related to hospital care (representing less than 2% of the data) were excluded from the purchased data set.

The data set is also detailed at product/brand and eventually package levels. Pharmaceutical companies generally provide drug packages standardized for the whole federal territory.¹⁶

The data were available on a specific software, "ORACLE sales Analyser", having a multidimensional cube structure: the product, the region, the time period, the channel of sales and measures of consumption. The data set was partially exported into MS Excel and STATA8 formats to perform the analysis.

¹⁴The dataset could not provide detailed information for areas with less than 5 pharmacies and/or drugstores. Hence, some small cantons were merged. Uri, Obvalden and Nidwalden were grouped together and included in Obwalden (OW), whereas Appenzell Outer-Rhodes and Appenzell Inner-Rhodes were included in Appenzell Rhodes (AR).

¹⁵In Switzerland around 50% of nursing homes have an internal pharmacy unit. Antibiotics delivered by the internal pharmacy are not included in the dataset and counted as hospital consumption.

¹⁶However, since different types of packages could also be sold in different proportions among geographical areas, we randomly compared the shares of packages sales for main categories of products across cantons by means of the coefficient of variation. The value was fairly low and very close to zero for most types of packages.

The Anatomical Classification (AC-system) provided by the European Pharmaceutical Market Research Association (EphMRA) classifies drugs into 16 groups at three or four levels with an alpha-numeric coding structure. All anti-bacterial agents (antibiotics) are identified by the alpha-numeric code J01. Antibiotics were disaggregated into different classes (for example, J01F macrolides) to investigate the consumption structure in section 2. Because the classification system of EphMRA does not perfectly match the international one, we rearranged some of the classes to obtain the standard antibiotic classes commonly used in international studies¹⁷. In particular, according to the EphMRA classification, broad spectrum penicillins (coded J01C) and medium and narrow spectrum penicillins (coded J01H) define two separate groups but have been grouped together in the ATC classification (J01 C penicillins). Quinolones are included in class M in the ATC international classification, whereas they fill class G for EphMRA. We finally summarized seven different classes : J01 A tetracyclines, J01 C penicillins, J01 D cephalosporins, J01 F macrolides, J01 M quinolones, J01 E sulfonamides and others.

Antibiotic sales are measured in terms of currency units (CHF) and the number of sold packages. Furthermore, the data set provides a third measure named Counting Units (CU). CU are defined in terms of milligrams and days of treatment (DOT). DOT are derived from milligrams using the total number of sold packages, the milligrams per package and the defined daily dosage (DDD) as $DOT = (\text{Number of packages})(\text{mg. per package})/DDD$. The latter measure, according to the WHO¹⁸, is

¹⁷The ATC classification used in international studies is an extension of the EphMRA classification suggested by Norwegian researchers in the 1970s. Since 1996, the use of the ATC and, more generally, of the ATC/DDD system is recognized by the WHO as the international standard.

¹⁸This is a constant for each active pharmaceutical ingredient. As the WHO emphasized, the

the assumed average maintenance dose per day for a drug used for its main indication in (by) adults. For some products like Penicillins, the standard counting unit is not the milligrams but the International Unit (IU) established by the UK National Institute for Medical Research. Hence, we adapted the above expression to consider IU instead of milligrams.

In addition to the original variables we calculated total per capita sales and days of treatment per 1000 inhabitants per day (DID) using demographic data at cantonal level. The latter measure constitutes the explained variable in all the three econometric models defined above. Since daily doses are standardized, our variable assumes that cantonal variations may be related to two main sources: the number of antibiotic treatments per 1000 inhabitants per period and the average dosage schedule for each treatment.

Since many explanatory variables were available for 2002 only, we estimated equation (2) by using four quarters. Because of the inclusion of lagged prices, *Model 2* and *Model 3* are instead estimated by using three quarters. As an exception, the level of education (EDU) refers to year 2000. Table 1 gives summary statistics of variables included in the models.

3.3 Estimation results

The parameter estimates of the three model specifications are summarized in table 2. All of the models give satisfactory and stable results. In the first model (*Model 1*) price and infections endogeneity is not addressed. *Model 2* includes lags of prices

DDD is a unit of measurement and does not necessarily reflect the recommended or the prescribed daily dose". For example, doses may depend on individual characteristics such as age and weight.

Variables	Unit of measurement	Min.	Med.	Max.
Outpatient antibiotic consumption (DID)	DDDs per 1000 inhabitants per day	4.28	7.89	18.49
Income per capita (Y)	Income (CHF)/pop.	35952	45746	77583
Price of a daily dose (P)	ales (CHF)/DDDs	3.40	3.72	4.32
Physicians' density (DPH)	Physicians/100000 inhab.	118	160	353
Population under 20 (UNDER20)	Under 20/pop.	0.17	0.24	0.26
Population age over 65 (OVER65)	Over 65/pop.	0.12	0.15	0.21
Share of foreign population (FO)	Foreign people/pop.	0.09	0.19	0.38
Percentage of people without post-mandatory education (EDU)	Basic education/pop.	0.19	0.24	0.32
Incidence of campylobacter infections (INF)	Number/100000 inhab.	92	115	187.7
Density of population (DPOP)	Inhabitants/ km^2	27	218	5149
Poverty rate (POV)	Proportion of pop. below wealth threshold	0.001	0.170	0.237
Mortality rate (MOR)	Mortality rate amenable to health care	22.39	29.81	34.807

Table 1: Variables notation and summary statistics

and the number of infections although observations are restricted to three quarters. The results are presented for both OLS and GLS estimation procedures. Moreover, we estimated the model by using OLS and report the Huber/White standard errors. Finally, *Model 3* is estimated by using two stage least squares. However, according to the Hausman test the null hypothesis of exogeneity cannot be rejected ($p=0.85$).

The majority of the coefficients are significantly different from zero and carry the expected sign in all the models. Each model accounts for more than 80% of observed cantonal variations in outpatient antibiotic DID. As for the interpretation of the results, some common points across the alternative specifications can be summarized.

The income coefficient is always very significant and shows a negative sign. This suggests that richer cantons generally spend less on outpatient antibiotics compared to lower-income cantons. Since per capita antibiotic sales and regressors are in logarithm form, the coefficients can be interpreted as elasticities. The responsiveness

of the outpatient antibiotic DID to a change in the average cantonal income, *ceteris paribus*, is around 0.5 in all of the specifications. This result suggests that anti-infectives may not be as strongly normal goods as argued by Baye et al. (1997), whose calculated income elasticity was 1.331. Differences may be related at least to three main reasons: the population under study, the time period considered, and the source of data. First, our analysis focuses on Swiss outpatient antibiotic expenditure whereas Baye et al. use USA data. The results may then suggest that the Swiss population is more keen on substituting antibiotics with alternative treatments when income increases. Findings may also imply that the Swiss population is more aware of the perverse effects of antibiotic consumption induced by bacterial resistance. This explanation can be supported by the relatively low per capita antibiotic consumption in Switzerland compared to other countries. Second, Baye et al.'s study is based upon 1984-1990 data. The raising concern over the impact of antibiotic resistance over the '90s may have reduced the income elasticity of outpatient antibiotic expenditure over time thus leading to our lower elasticity value. Finally, Baye et al. use retailing prescription data collected through surveys of a sample of pharmacies. Instead, we use total outpatient antibiotic wholesales to pharmacies, drugstores and medical practices. Our data may not capture the effect of retailing strategies associated with income because they are not directly related to the final consumer.

The level of education is negatively related to the per capita outpatient antibiotic expenditure defined in DID. The coefficient is significant at less than 0.05 in all the regressions and shows that an increase in the percentage of people without post-mandatory education increases the per capita antibiotic expenditure defined in

DID. Education elasticities range from 0.317 to 0.442. To our knowledge there are not comparable multivariate studies on the impact of education on the use of outpatient antibiotics. A comparison with the literature on medical care utilization, such as physician office visits or hospital services, suggests that antibiotics are quite peculiar, as expected. Hunt-McCool et al. (1994) found positive education elasticity to physician office visits and hospital care, although the impact is not very significant. The same kind of impact may not be expected for outpatient antibiotic use where the association between increasing consumption and the reduced effectiveness due to resistance may induce more informed individuals to restrain from antibiotic utilization. Lleras-Muney and Lichtenberg (2002) found that highly educated people are generally more likely to use drugs more recently approved by the Food and Drug Administration, with the exception of some disease categories such as infectious diseases where antibiotics are generally consumed.

In terms of the investment in health function in the Grossman model the results suggest that relatively rich and highly educated people either use health care inputs (antibiotics) more efficiently or have higher initial health stocks. Higher levels of productivity imply that the same amount of health investment can be obtained by a lower amount of health care services. Also, higher initial health stocks imply that lower investment in health, and hence in health care inputs, are required for any given level of optimal health stocks, *ceteris paribus*.

As expected the price of a daily dose has a negative and slightly significant impact on antibiotic sales. Price elasticities range from -0.561 (GLS of *Model 1*) to -0.606 in the lagged model (*Model 2*). Swiss consumers directly bear only a small fraction of

the total cost of drugs because of compulsory health insurance purchasing. However, antibiotic sales may be affected by price changes because of standardized deductibles and copayments. On the other hand, the demand for antibiotics may be more inelastic compared to other types of drugs since antibiotics are generally purchased under doctor's prescription. Our estimates are slightly lower than those of Baye et al. (1997) who found negative compensated (-0.785) and uncompensated (-0.916) own-price effects for anti-infectives. Still, they may support their argument that anti-infectives have the largest own-price elasticities among all major pharmaceutical classes. Focusing on the demand for one antibiotic class, the cephalosporins, Ellison et al. (1997) calculated own-price elasticities for different brand/generic names unconditional on drug expenditure and using US wholesale data from 1985 to 1991. Their estimates range from -0.38 to -4.34 . Our results could also be compared to the ones found in Rudholm (2003) who derives own-price elasticities for three Swedish pharmaceutical submarkets during the years 1989-1996. The prescription drug market for beta-receptor blocking agents is maybe the closest to our outpatient antibiotic market, although not exactly the same. Mean own-price elasticities calculated by Rudholm are also negative and significant at 5% level ranging between -0.12 to -3.43 . A shorter range (from -1.62 to -2.13) is covered by elasticities estimated by Rizzo (1999) using wholesales data from the US antihypertensive drug market.

An increase in the number of physicians at cantonal level causes an increase in the cantonal per capita antibiotic DID. The coefficients of physicians' density are positive and highly significant. Estimated elasticities are also very stable across different model specifications ranging from 0.543 to 0.680. This result may suggest some evi-

dence of supply-induced demand in the Swiss market for outpatient anti-infectives.¹⁹ Note that antibiotics should only be purchased under physician's prescription. Under the assumption that the mismatching between wholesale figures and physicians' prescriptions can be ignored, our findings may support the hypothesis that physicians do not act as perfect agents for consumers.²⁰ This is also in accordance with the health economics literature suggesting that in systems where physicians are paid under a fee-for-service scheme, akin to the Swiss one, overconsumption of drugs is more likely. Given that daily doses are standardized, our result suggests that cantonal variations in physician's practices may either take the form of differences in the number of antibiotic treatments per person or differences in daily dosage schedule. A different result to ours is obtained by Di Matteo and Grootendorst (2002) who estimate the socioeconomic and demographic determinants of real per capita Canadian provincial government drug expenditure. In their study the per capita number of prescribing physicians is found to be a negative, although not a significant, determinant of the Canadian drug expenditure. However, it is important to point out that the health care system under investigation exhibits substantial differences compared to the Swiss one.

To capture the effects of demography on antibiotic sales we included as covariates the proportions of the population aged below 20 and over 65. One might expect a drug expenditure decline during the first few years of life followed by an increase as the population ages. The literature on the determinants of health care expenditure

¹⁹For an exhaustive discussion on the supplier induced demand theory see McGuire (2000).

²⁰This means that physicians may not choose the same doses or type of antibiotic as the patient would if he/she was as much informed as the physician.

generally suggests that the increasing prevalence of chronic health problems as people grow older may determine an increase in the utilization of health care services. For instance, Di Matteo and Di Matteo (1998) investigated the determinants of the real per capital provincial government health expenditure in Canada using a log-log functional form. They calculated a 0.81 elasticity of the proportion of the population aged over 65. In a similar study Di Matteo and Grootendorst found a slightly significant increase in drug expenditure as the population ages until 64. Between 64 and 74 the effect is still positive although this result is not confirmed by the more recent study by Di Matteo (2005). We argue, however, that the consumption of anti-infectives in the community may be quite different from other health care services and consequently does not follow the same trend over the life-time. First, doctors and patients might be more concerned about the potential harmful effect of prescribing antibiotics to very young and elderly individuals. Antibiotic treatment is more likely to be delayed for these individual categories to avoid resistance implications. Second, the antibiotic therapy may sometimes be conceived as a time-saving choice and hence more likely to be adopted by individuals belonging to the labor forces. These hypothesis are in accordance with the results of a French study conducted on a panel of general practitioners and focusing on antibiotic prescriptions for rhynopharyngeal infections (Mousquès et al., 2003). Antibiotics are less likely to be prescribed to the population class aged below 16 compared to the 40-64 population class. On the other hand, individuals over 64 are less likely to get an antibiotic prescription. Similarly, we obtained negative and significant coefficients of the proportion of individuals over 65 (from -0.667 to -1.027). We also found a negative impact of the proportion of

the population aged under 20 on the per capita antibiotic DID. However, this result is not significant.

Another important factor that may be related to differences in outpatient antibiotic expenditure across Swiss cantons are the cultural and linguistic variations. One can argue that cantons adjacent to countries such as France, Germany and Italy could share similar cultural attitudes for at least two reasons. First, the public perception of the need for antibiotics may be influenced by the perception of neighboring populations. Second, cantonal “medical attitudes” to prescribing may be influenced by “medical attitudes” in neighboring countries. These hypothesis are worth testing also in the light of differences observed in antibiotic consumption between adjacent countries (Goossens et al., 2005). Both cultural covariates introduced in our models exhibit significant coefficients. The share of foreign people on the total population increases the cantonal per capita outpatient antibiotic expenditure. This result was expected because of the lower Swiss antibiotic consumption compared to adjacent countries. The “latin” dummy suggests that antibiotic expenditure is higher in French and Italian speaking cantons compared to German speaking cantons, which is also in accordance with the hypothesis above.

The number of infections is significant at less than 5% level both in the lagged and in the two-stage least squares specifications. Coefficients exhibit the expected positive sign and suggest that outpatient antibiotic expenditure is not much elastic to the impact of epidemiological factors. Looking at the pharmaceutical consumption for cardiovascular disease and stroke, Dickson and Jacobzone (2003) found that drug use may be strongly related to indicators of the burden of disease for more effective

	Model 1				Model 2				Model 3	
	OLS		GLS		OLS		GLS		2SLS	
Obs.	92				69				69	
(Adj.) R ²	0.887				0.90				0.894	
	Coeff.	Robust S.E.	Coeff.	S.E.	Coeff.	Robust S.E.	Coeff.	S.E.	Coeff.	S.E.
Constant	0.383	1.394	2.636 ^b	1.160	1.146	1.191	2.404 ^c	0.770	1.644	1.381
Y	-0.509 ^d	0.108	-0.515 ^d	0.098	-0.477 ^d	0.100	-0.490 ^d	0.071	-0.519 ^d	0.114
P _t	-0.595 ^a	0.326	-0.561 ^c	0.198	-	-	-	-	-	-
P _{t-1}	-	-	-	-	-0.606 ^a	0.331	-0.570 ^d	0.178	-0.564 ^a	0.295
DPH	0.680 ^d	0.111	0.543 ^d	0.100	0.629 ^d	0.116	0.613 ^d	0.073	0.650 ^d	0.110
UNDER20	-0.372	0.261	-0.054	0.246	-0.350	0.281	-0.004	0.181	-0.257	0.275
OVER65	-1.027 ^d	0.220	-0.691 ^d	0.211	-0.885 ^d	0.212	-0.667 ^d	0.136	-0.864 ^d	0.179
FO	0.186 ^c	0.064	0.246 ^d	0.057	0.194 ^d	0.057	0.264 ^d	0.041	0.221 ^b	0.060
EDU	0.442 ^c	0.165	0.168	0.143	0.318 ^b	0.162	0.317 ^c	0.101	0.350 ^b	0.133
INF	0.201 ^c	0.084	0.312 ^d	0.066	-	-	-	-	0.157 ^b	0.078
MEANINF	-	-	-	-	0.172 ^b	0.085	0.164 ^d	0.045	-	-
DLATIN	0.173 ^d	0.042	0.220 ^d	0.043	0.171 ^d	0.045	0.153 ^d	0.031	0.154 ^c	0.049
DT ₁	0.077 ^b	0.037	0.073 ^d	0.014	-	-	-	-	-	-
DT ₂	-0.205 ^d	0.027	-0.206 ^d	0.014	-0.171 ^d	0.029	-0.176 ^d	0.015	-0.173 ^d	0.028
DT ₃	-0.178 ^d	0.027	-0.184 ^d	0.011	-0.166 ^d	0.027	-0.180 ^d	0.013	-0.166 ^d	0.026

^asignificant at 10%, ^b significant at 5%, ^csignificant at 1%, ^dsignificant at 0.1%,

Table 2: Parameter estimates for the three models.

and inexpensive types of drugs only. It is important to point out that the lack of quarterly data on the prevalence of bacterial infections in our dataset may dilute the seasonal impact on antibiotic consumption. Seasonal effects are then captured by time dummies.

Time dummies clearly suggest that there are some seasonal effects in antibiotic consumption in ambulatory care. The baseline season is represented by the third quarter, i.e. the *autumn* dummy (October, November, December). Per capita outpatient antibiotic DID are expected to be higher during the fourth quarter, *winter* (January, February, March), and lower in the first and the second quarter of the year, as pointed out by Goossens et al.. Accordingly, the estimated coefficients of DT_2 and DT_3 are both negative and highly significant in all the three models. The *winter* dummy appears in *Model 1*. This is positive and significant at less than 5% level.

4 Conclusions

The investigation of regional variations in outpatient antibiotic use may help to understand the determinants of the demand for antibiotics and contribute to the discussion on the reduction of antibiotic resistance. There is a lack of empirical evidence in the analysis of within country variations in outpatient antibiotic consumption. Wide differences in the utilization of drugs were observed, for instance, between three major urban areas in Sweden (Wessling et al. 1991).

We analysed cantonal outpatient antibiotic sales in Switzerland. We showed that the country uses relatively low volumes of antibiotics in ambulatory care compared to other European countries. In terms of consumption structure, Switzerland is characterized by high proportions of quinolones.

Antibiotic use in ambulatory care significantly increased in terms of defined daily doses per 1000 inhabitants daily and sales per capita between 2002 and 2003 in most Swiss cantons. Conversely, consumption generally decreased in 2004.

The investigation of cantonal differences showed that there are wide variations across cantons. These can hardly be explained by epidemiological factors only. Econometric estimations on quarterly data for 2002 suggested that per capita income, price, demographic factors, including the proportion of foreign residents, the density of medical practices, and cultural and educational differences may contribute to explain regional variations in ambulatory antibiotic use.

More effective policies to improve the efficient use of antibiotics in the community may be driven by these findings. Appropriate incentives affecting antibiotic consump-

tion and, consequently, levels of bacterial resistance can be designed by looking at crucial determinants suggested in the model and their relative impact. A number of studies suggest, for instance, that inappropriate individual consumption is associated with the lack of awareness of the danger of antibiotic use (Mazzaglia et al., 1999; Vanden Eng et al., 2003). We showed that higher level of education may account for lower antibiotic use in the community. Cantonal educational efforts are then needed if the consumption of antibiotics is to be reduced. Moreover, local guidelines could represent a valid tool given the evidence that per capita antibiotic consumption is associated with the density of general practices. The cantonal public health authorities should then promote local guidelines with adequate incentives for doctors and effective information campaigns for appropriate antibiotic use.

Econometric models using data at local level and the application of multiple-choice models to selected categories of antibiotics should be explored to further explain small area variations in outpatient antibiotic use. Additional suspicious determinants like bacterial resistance and prescribing practices should also be considered.

References

- Baye MR, Maness R, and Wiggins SN. "Demand systems and the true subindex of the cost of living for pharmaceuticals", *Applied Economics*, 29, 1179-1189, 1997.
- Becker GS. "A Theory of the Allocation of Time", *Economic Journal*, 75, 493-517, 1965.
- Belongia EA, and Schwartz B. "Strategies for promoting judicious use of antibiotics by doctors and patients", *BMJ*, 317, 668-671, 1998.
- Bergan T. "Antibiotic usage in Nordic countries", *International Journal of Antimicrobial Agents*, 18, 279-82, 2001.
- Bouvenot G, "L'Observatoire national des prescriptions et consommations de médicaments. Prescription et consommation des antibiotiques en ambulatoire", *Bulletin de l'Académie nationale de Médecine*, 183(3), 601-609, 1999.
- Bremon AR, et al. "Non-hospital consumption of antibiotics in Spain: 1987-1997", *Journal Antimicrobial Chemotherapy*, 45, 395-400, 2000.
- Butler CC, et al. "Understanding the culture of prescribing: qualitative study of general practitioners' and patients' perceptions of antibiotics for sore throats", *BMJ*, 317, 637-642, 1998.
- Cantrell R, Young AF, and Martin BC. "Antibiotic prescribing in ambulatory care settings for adults with colds, upper respiratory tract infections, and bronchitis", *Clinical Therapeutics*, 24, 170-182, 2002.
- Cars O, Molstad S, and Melander A. "Variation in antibiotic use in the European Union", *Lancet*, 357, 1851-1853, 2001.
- Cizman M. "The use and resistance to antibiotics in the community", *International Journal of Antimicrobial Agents*, 21, 297-307, 2003.

- Cockburn J, and Pit S. "Prescribing behaviour in clinical practice: patients' expectations and doctors' perceptions of patients' expectations - a questionnaire study", *BMJ*, 315, 520-523, 1997.
- Coast J, Smith RD, and Millar MR. "An economic perspective on policy to reduce antimicrobial resistance", *Social Science and Medicine*, 46(1), 29-38, 1998.
- Davey PG, Bax RP, Newey J, Reeves D, Rutherford D, Slack R, Warren RE, Watt B and Wilson J. "Growth in the use of antibiotics in the community in England and Scotland in 1980-93", *British Medical Journal*, 312, 613, 1996.
- Di Matteo L. "The macro determinants of health expenditure in the United States and Canada: assessing the impact of income, age distribution and time", *Health Policy*, 71, 23-42, 2005.
- Di Matteo L, and Di Matteo L. "Evidence on the determinants of Canada provincial government health expenditures: 1965-1991", *Journal of Health Economics*, 17, 211-228, 1998.
- Di Matteo L, and Grootendorst P. "Federal patent extension, provincial policies, and drug expenditures, 1975-2000", *Canadian Tax Journal*, 50(6), 2002.
- Dickson M, and Jacobzone S. "Pharmaceutical use and expenditure for cardiovascular disease and stroke: a study of 12 OECD countries", *OECD Health Working Papers*, 2003.
- Elbasha EH. "Deadweight loss of bacterial resistance due to overtreatment", *Health Economics*, 12, 125-138, 2003.
- Ellison SF, Cockburn I, Girilches Z, and Hausman J. "Characteristics of demand for pharmaceutical products: an examination of four cephalosporins", *RAND Journal of Economics*, 28, 426-446, 1997.

- Finch RG, Metlay JP, Davey PG, Baker LL. "Educational interventions to improve antibiotic use in the community: report from the International Forum on antibiotic resistance (IFAR) colloquium", *Lancet*, 4, 44-53, 2004.
- Goossens H, Ferech M, Vander Stichele R, Elseviers M, The ESAC Project Group, "Out-patient antibiotic use in Europe and association with resistance: a cross-national database study", *Lancet*, 365, 579-587, 2005.
- Greene WH. *Econometric Analysis*, New York: Prentice Hall, 2003.
- Grossman M, "On the Concept of Health Capital and the Demand for Health," *JPE*, 80, 223-255, 1972.
- Guillemot D, Maison P, Carbon C, Balkau B, Vauzelle-Kervroedan F, Sermet C, Bouvenot G, Eschwege E. "Trends in antimicrobial drug use in the community—France 1981-1992", *Journal of Infectious Disease*, 177, 492-497, 1998.
- Harbarth S, Albrich W, and Brun-Buisson C. "Outpatient antibiotic use and prevalence of antibiotic-resistance pneumococci in France and Germany: a sociocultural perspective", *Emerging Infectious Diseases*, 8(12), 2002.
- Homer J, et al. "Toward a dynamic theory of antibiotic resistance", *System Dynamics Review*, 16(4), 287-319, 2000.
- Hunt-McCool J, Kiker BF, and Ng YC. "Estimates of the demand for medical care under different functional forms", *Journal of Applied Econometrics*, 9(2), 201-218, 1994.
- Kmenta J. *Elements of Econometrics*, 2d edition. New York: Macmillan Publishing Company, 1986.
- Laxminarayan R, and Weitzman ML. "On the implications of endogenous resistance to medications", *Journal of Health Economics*, 21, 709-718, 2002.

- Lecomte T, and Paris V. “Consommation de pharmacie en Europe - Allemagne, France, Italie, Royaume-Uni”, *CREDES*, 1994.
- Ledergerber U, et al. “Risk factors for antibiotic resistance in *Campylobacter* spp. isolated from raw poultry meat in Switzerland”, *BMC Public Health*, 3(1), 39, 2003.
- Levy SB. “The challenge of antibiotic resistance”, *Scientific American*, 278(3), 46-53, 1998.
- Lleras-Muney A, and Lichtenberg FR. “The effect of education on medical technology adoption: are the more educated more likely to use new drugs?”, *NBER Working Paper* 9185, 2002.
- Mazzaglia G, Arcoraci V, Greco S, Cucinotta G, Cazzola M, and Caputi AP. “Prescribing habits of general practitioners in choosing an empirical antibiotic regimen for lower respiratory tract infection in adults in Sicily”, *Pharmacological Research*, 40(1), 47-52, 1999.
- McCaig LF, Besser RE, and Hughes JM. “Antimicrobial drug prescriptions in ambulatory care settings, United States, 1992-2000”, *Emerging Infectious Diseases*, 9(4), 432-437, 2003.
- Mecfarlane J, et al. “Reducing antibiotic use for acute bronchitis in primary care: blinded, randomised controlled trial of patient information leaflet”, *BMJ*, 315, 1211-1214, 2002.
- McGowan JE. “Economic impact of antimicrobial resistance”, *Emerging Infectious Diseases*, 7(2), 286-292, 2001.
- McGuire T. “Physician agency”, in: AJ Culyer and JP Newhouse, eds. *Handbook of health economics*, Vol. 1, Ch. 9, 2000.
- Mousquès J, Renaud T, and Scemama O. “Variabilité des pratiques médicales en médecine générale: la prescription d’antibiotiques dans la rhinopharyngite aiguë”, Centre de Recherche d’Etude et de Documentation en Economie de la Santé, *CREDES, série analyse*, 2003.
- Newhouse JP. *Free for all? Lessons from the Rand Health Insurance Experiment Group*.

Harvard University press, Cambridge, 1993.

Nolte E, and McKee M. "Measuring the health of nations: analysis of mortality amenable to health care" *BMJ*, 327, 1129, 2003.

OECD. *OECD Health Data*, 2003.

Rizzo JA. "Advertising and competition in the ethical pharmaceutical industry: the case of antihypertensive drugs", *Journal of Law and Economics*, 42, 89-116, 1999.

Rowthorn R, and Brown GM. "Using antibiotics when resistance is renewable" in Laxminarayan R, *Battling resistance to antibiotics and pesticides*, 1994.

Rudholm N. "Economic implications of antibiotic resistance in global economy", *Journal of Health Economics*, 21, 1071-1083, 2002.

Rudholm N. "Competition and substitutability in the Swedish pharmaceuticals market", *Applied Economics*, 35, 1609-1617, 2003.

Rutstein DD, Berenberg W, Chalmers TC, et al. "Measuring the quality of medical care. A clinical method". *N Engl J Med*, 294, 582-8, 1976.

Scott T. "The economics of general practice", in: AJ Culyer and JP Newhouse, eds., *Handbook of Health Economics*, Vol. 1, Ch. 22, 2000.

Steinman MA, Gonzales R, Linder JA, Landefeld CS. "Changing use of antibiotics in community-based outpatient practice 1991-1999", *Annals of Internal Medicine*, 138(7), 525-534, 2003.

Unsworth L, and Walley T. "Trends in primary care antibiotics prescribing in England 1994-1998", *Pharmacoepidemiology and Drug Safety*, 10, 309-314, 2001.

Vanden Eng J, Marcus R, Hadler JL, Imhoff B, Vugia DJ, Cieslak PR, Zell E, Deneen V, McCombs KG, Zansky SM, Hawkins MA, and Besser RE. "Consumer attitudes and use of

antibiotics”, *Emerging Infectious Diseases*, 9(9), 1128-1135, 2003.

Webb S, Lloyd M. “Prescribing and referral in general practice: a study of patients’ expectation and doctors’ actions”, *Br J Gen Pract*, 44(381), 165-169, 1992.

Wennberg JE, and Gittelsohn A, “Variation in medical care among small areas”, *Scientific American*, 246, 120-134, 1982.

WHO, “Overcoming antimicrobial resistance”, *World health report on infectious diseases*, 2000.

WHO, *The WHO global strategy for containment of antimicrobial resistance*, 2001.

Wise R, et al. “Antimicrobial resistance. Is a major threat to public health”, *BMJ*, 317, 609-610, 1998.

Wessling A, Bergman U, and Westerholm B. “On the differences in psychotropic drug use between the three major urban areas in Sweden”, *Eur J Clin Pharmacol*, 40(5), 495-500, 1991.